

# *The Impact of Cell Dropping Policies in ATM Networks*

Zhen LIU      Rhonda RIGHTER

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# The Impact of Cell Dropping Policies in ATM Networks

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**Abstract:** We consider policies for deciding which cells will be lost or dropped when losses occur at a finite buffer ATM node. The performance criteria of interest are the delay of transmitted (non-lost) cells, the jitter (or variability in the delay of transmitted cells), and the burstiness of lost cells. We analyze the performance tradeoffs for various cell dropping policies. We show the usual the “rear dropping” in which cells that arrive to a full buffer are lost stochastically maximizes delay, while “front dropping,” in which cells at the front of the buffer are lost, stochastically minimizes delay. On the other hand, rear dropping stochastically minimizes the jitter. We also propose policies that have both stochastically smaller delay and less lost cell burstiness in a stochastic majorization sense than the rear dropping policy.

**Key-words:** Jitter, Loss Burstiness, ATM Networks, Stochastic Majorization, Stochastic Orderings, Finite Buffer Queues

*(Résumé : tsvp)*

**Correspondence:** Zhen LIU, INRIA, Centre Sophia Antipolis, 2004 route des Lucioles, B.P. 93, 06902 Sophia-Antipolis, France. e-mail: Zhen.Liu@sophia.inria.fr

# L'impact des politiques de rejet des cellules dans les réseaux ATM

**Résumé :** Nous considérons l'impact sur les performances des politiques de rejet des cellules dans un commutateur ATM. Les critères de performance qui nous intéressent sont le délai des cellules transmises (non perdues), la gigue (variation du délai des cellules transmises), et le processus de rafales des pertes (nombre de cellules perdues consécutivement). Différentes politiques de rejet des cellules ont été analysées. Nous prouvons (1) que la politique de rejet "rear dropping" qui écarte systématiquement les cellules trouvant un tampon plein maximise le délai et minimise la gigue pour l'ordre stochastique, et (2) que la politique "front dropping" qui rejette la cellule en tête du tampon minimise le délai pour l'ordre stochastique. Nous proposons aussi des politiques générant à la fois des faibles délais et des courtes rafales de cellules perdues.

**Mots-clé :** Gigue, rafale de perte, réseaux ATM, majoration stochastique, ordre stochastique, file d'attente avec capacité finie.

# 1 Introduction

We consider a single node of an ATM (Asynchronous Transfer Mode) network, in which messages are sent in packets or cells of a constant size. We study the delay of transmitted (unlost) cells, the jitter, or variability, in the delay, and the burstiness of lost cells. All of these issues are important with voice traffic for example. Voice traffic cannot tolerate long delays or much jitter. Also, voice messages can tolerate some losses, but will be more intelligible if the losses do not occur in groups of consecutive cells.

On the other hand, there are cases when it may be desirable to have losses occur in bursts. For example, when cells of data are grouped into larger packets, under some protocols if one cell in the packet is lost the entire packet must be retransmitted. Several cell discard algorithms have been proposed in the literature, see e.g. Kawahara et al. (1996).

Less burstiness in cell losses may again be preferred if there are some redundant cells in the packet. Indeed, in this case one may often be able to reconstruct lost cells and thus reduce packet losses. The reader is referred to Cidon et al. (1993) and references therein for details on how redundancy is used for error recovery.

Since cells have a fixed size, and the transmission rate is constant, we can assume service times are deterministic. We thus consider a discrete time  $G/D/C(t)/b$  queue, where the time slot equals the service time, which we take equal to 1 without loss of generality, and where  $b$  is the buffer size including the cell in service. The number of arrivals in each time slot is an arbitrary stochastic process that is independent of the identities of the cells in the buffer, though it may depend on the queue length. We assume that the service discipline is FCFS (first-come-first-served). The number of available servers at any time  $t$ ,  $C(t)$ , may be a random variable representing for example the bandwidth of an ATM node allocated to a particular connection at time  $t$ . The process  $C(t)$  may depend on the number of cells in the buffer (queue length), but is otherwise independent of the identities (indices) of the cells in the buffer. We assume that  $C(t) \geq 1$  with probability 1 whenever the queue length is non-zero.

It is generally assumed that arrivals that find the buffer full are lost. Such a policy is called “rear dropping.” An alternative policy is “front dropping”, where cells at the front of the buffer (the ones that arrived earliest) are lost and the cells remaining in the buffer move up to the front, making room for new arrivals at the rear.

Some results exist in the literature for the single-server case (the  $G/D/1/b$  queue). It is easy to show, see Yin and Hluchyj (1993), that all dropping policies yield identical queue length distributions, provided dropping occurs only when there is buffer overflow, and that front dropping results in smaller delays for transmitted cells than rear dropping (or any other dropping, or “push-out,” policy). Yin

and Hluchyj (1993) also provide the delay distributions for both front and rear dropping under FCFS assuming a talk spurt model for arrivals. Schulzrinne (1993) shows that the same cells (as identified by their order of generation) will be dropped for all work conserving service policies and rear dropping, and that the distribution of loss runs under FCFS is the same for both rear and front dropping. Clare and Rubin (1986) give the delay distributions of transmitted cells for FCFS with front dropping and LCFS (last-come-first-served) with front dropping when the distribution of arrivals in each time slot is independent and identically distributed (i.i.d.). They show that rear dropping maximizes the mean waiting time for transmitted cells under any work conserving service discipline, and that LCFS with front dropping minimizes the mean waiting time over all service disciplines and dropping policies. However, FCFS has the desirable properties that waiting times are strictly bounded and the order of transmitted cells is preserved.

Lakshman, Neidhardt, and Ott (1996) show that for networks using TCP, the Internet transfer protocol, a front dropping policy results in better performance and allows the use of smaller buffers than rear dropping. During congestion episodes when buffers are full, front dropping causes the destination to “see” missing cells approximately one buffer drain time earlier than under rear dropping. The sources correspondingly receive earlier duplicate acknowledgements and can adjust accordingly.

In this paper we consider the  $G/D/C(t)/b$  queueing model under the above mentioned assumptions. Such a model can be used for the analysis of either a single dedicated ATM node or a particular source with its own input buffer in an ATM node with multiple sources sharing the channels. For both front and rear dropping if more than one cell is lost in a time slot, a “burst” of consecutive cells will be lost. We show that the loss burstiness is the same for both front and rear dropping, assuming cells are only lost when the buffer is full. We give a bound on the difference in mean delay for front and rear dropping and show that rear dropping minimizes jitter (defined later) over all dropping policies. We propose new policies, referred to as *splitting* policies, and show that they have less bursty losses in a majorization sense than front or rear dropping, while their delays are between that of front dropping and rear dropping. We provide specific bounds on their mean delay relative to the front and rear dropping policies. The effect of such policies on the loss burstiness and jitter are evaluated using simulation and compared to a random splitting policy.

The paper is organized as follows. We define our model and assumptions in section 2. We also present some basic properties of majorization and stochastic orderings. In section 3 we compare the two dropping policies: front dropping and rear dropping. We consider different performance measures such as delay, jitter, and loss burstiness. The result pertaining to the jitter minimization is valid for a large class of dropping policies. In section 4 we propose two new classes of policies, parameterizable by a threshold, which we refer to as split and batch policies. The front and rear dropping policies turn out to be special cases of these new policies. We present properties of split and batch policies

with respect to the performance measures of interest. In section 5 we present simulation results in order to illustrate the effect of the threshold on these policies. We also compare our policies with a random-dropping policy. The comparison has been performed for two (somewhat extreme) input traffic patterns: Poisson arrivals and a process with long-range dependence. Finally, in section 6 we present our conclusions.

## 2 Preliminaries

### 2.1 Basic Model Assumptions and Definitions

We use smaller, increasing, etc. in the nonstrict sense.

We will consider a discrete time G/D/C(t)/b queue, where the time slot equals the service time, which we take equal to 1. There is a finite-capacity buffer of size  $b$ , including the cell in service. The number of servers  $C(t)$  available at time  $t$  is a random variable. The service process  $C(t)$  can depend on the number of cells in the buffer (queue length), but is otherwise independent of the identities (indices) of the cells in the buffer. We assume that  $C(t) \geq 1$  with probability 1 whenever the queue length is non-zero. The number of arrivals in each time slot is an arbitrary stochastic process that is independent of the identities of the cells in the buffer, though it may depend on the queue length. The arrival process is arbitrary and can depend on the queue length, but not on the identities of cells in the queue. Moreover, the arrival process and the service process  $C(t)$  can be mutually dependent.

We consider dropping policies in which cells are dropped only when the buffer is full, and we never drop more cells than we have to. We also assume the service discipline is FCFS, and that cells are always ordered by their arrival times in the buffer. Then since we only drop cells when the buffer overflows, and since all cells have a service time equal to 1, the queue size, the number of transmissions (either 0 or 1), and the number of losses in any time slot is the same under any dropping policy for any fixed arrival process and service process. Therefore, dropping policies affect only the identities of lost cells, not the times at which they are lost, and similarly, they affect only the identities of transmitted cells, and not the transmission times.

In our study, we shall assume that the processes for arrivals and number of available servers are fixed arbitrarily. We assume there will be a total of  $N < \infty$  arrivals. Let  $L$  and  $T$  be the total number of losses and transmitted cells respectively in the  $N$  arrivals. Thus,  $T + L = N$ . Cells are indexed according to their order of arrival, and we assume them to be ordered within batches of arrivals (arrivals that occur during the same time slot). Suppose there is a “virtual” buffer of infinite size that includes the “real” buffer of size  $b$ , such that at the end of a time slot all arrivals during that time slot are placed in the buffer in order after the cells that are already present. If there are at most  $b$  cells in

the virtual buffer, no cells are lost. If there are more than  $b$  cells, say  $b + a$ , where  $a > 0$ , then  $a$  cells must be dropped.

We assume that the arrival times of all cells in the buffer are known, and we permit policies that use this information. However, as we will see, optimal policies will depend only on the order of arrivals, through the buffer positions of the current cells.

Let  $a_i$  be the arrival time of cell  $i$ . If cell  $i$  is transmitted, we define its completion time,  $c_i$ , as the time at which it has finished its transmission at the ATM node, and we define its delay  $d_i$  as  $c_i - a_i$ . If cell  $i$  is lost, we let  $l_i$  be the time at which it is lost, and we define its delay as  $l_i - a_i$ . For any policy  $\pi$  let  $T^\pi$  and  $L^\pi$  be the set of transmitted and lost cells respectively and let  $\bar{d}_T^\pi$ ,  $\bar{d}_L^\pi$ , and  $\bar{d}^\pi$  be the average delay for transmitted, lost, and all cells respectively. Let  $D_T^\pi$ ,  $D_L^\pi$ , and  $D^\pi$  be the corresponding total delays.

## 2.2 Stochastic Ordering and Majorization

We now give some brief definitions and useful facts relating to stochastic orderings and majorization. For further details and proofs, see Marshall and Olkin (1979).

Recall that for two random vectors  $\mathbf{X}$  and  $\mathbf{Y}$ ,  $\mathbf{X}$  is stochastically larger than  $\mathbf{Y}$ ,  $\mathbf{X} \geq_{st} \mathbf{Y}$ , if and only if  $E(g(\mathbf{X})) \geq E(g(\mathbf{Y}))$  for all component-wise increasing functions  $g(\mathbf{t})$ , provided the expectations exist. Also,  $\mathbf{X} \geq_{st} \mathbf{Y}$  if and only if it is possible to construct two coupled random vectors, that is, two random vectors on the same probability space,  $\hat{\mathbf{X}}$  and  $\hat{\mathbf{Y}}$ , such that  $\hat{\mathbf{X}} =_{st} \mathbf{X}$ ,  $\hat{\mathbf{Y}} =_{st} \mathbf{Y}$ , and  $\hat{\mathbf{X}} \geq \hat{\mathbf{Y}}$  with probability 1.

For two  $m$  dimensional real vectors  $\mathbf{x}$  and  $\mathbf{y}$ ,  $\mathbf{x}$  majorizes  $\mathbf{y}$ ,  $\mathbf{x} \succ \mathbf{y}$ , if  $\sum_{i=1}^k x_{[i]} \geq \sum_{i=1}^k y_{[i]}$ , for  $k = 1, \dots, m-1$  and  $\sum_{i=1}^m x_{[i]} = \sum_{i=1}^m y_{[i]}$ , where  $x_{[i]}$  is the  $i^{th}$  largest component of  $\mathbf{x}$ . Intuitively,  $\mathbf{y}$  is better balanced than  $\mathbf{x}$ . A function  $f$  is said to be Schur-convex if  $f(\mathbf{x}) \geq f(\mathbf{y})$  whenever  $\mathbf{x} \succ \mathbf{y}$ . For two random vectors  $\mathbf{X}$  and  $\mathbf{Y}$ ,  $\mathbf{X}$  is larger than  $\mathbf{Y}$  in the Schur-convex sense,  $\mathbf{X} \geq_{scx} \mathbf{Y}$ , if and only if  $E(g(\mathbf{X})) \geq E(g(\mathbf{Y}))$  for all Schur-convex functions  $g(\mathbf{t})$ . Also,  $\mathbf{X} \geq_{scx} \mathbf{Y}$  if and only if it is possible to construct two coupled random vectors, that is, two random vectors on the same probability space,  $\hat{\mathbf{X}}$  and  $\hat{\mathbf{Y}}$ , such that  $\hat{\mathbf{X}} =_{st} \mathbf{X}$ ,  $\hat{\mathbf{Y}} =_{st} \mathbf{Y}$ , and  $\hat{\mathbf{X}} \succ \hat{\mathbf{Y}}$  with probability 1.

## 3 Front and Rear Dropping

Suppose in a particular time slot  $a$  cells must be dropped. Under rear dropping (denoted by R) the cells in virtual buffer positions  $b+1, \dots, b+a$  are lost. Under front dropping (denoted by F) the cells



in buffer positions  $1, \dots, a$  are lost and the remaining cells are moved up to positions  $1, \dots, b$ , into the real buffer. After the dropping policy is implemented the cell in position 1 is then served during the next time slot, and the process is repeated at the end of the next time slot with the arrivals that occur during that slot.

### 3.1 Delays for Front and Rear Dropping

Let  $i^F(k)$  ( $i^R(k)$ ) be the index of the  $k^{th}$  cell to be lost under front (rear) dropping. We have the following lemma that says that the indices of lost cells under front and rear dropping are just shifted versions of each other.

**Lemma 3.1** *For fixed arrival and service processes,*

$$i^R(k) = i^F(k) + b.$$

*Proof.* Consider any time slot in which there are losses, say  $a$  of them. Note that under FCFS with front dropping, the cells in the virtual buffer always have consecutive indices, and under both front and rear dropping any cells that are in the virtual buffer but not in the real buffer are labeled consecutively and are the most recent arrivals. Therefore, let  $l$  be such that the indices of the cells in positions  $b+1, b+2, \dots, b+a$  are  $l+1, l+2, \dots, l+a$  under both policies. Then cells  $l+1, \dots, l+a$  are lost under rear dropping, and cells  $l+1-b, \dots, l+a-b$  are lost under front dropping since under front dropping the cells in the virtual buffer are consecutive.  $\square$

Using lemma 3.1 we can bound the difference in the average delay for transmitted cells under front and rear dropping. That is,

$$\bar{d}_T^\pi = \frac{1}{T} D_T^\pi = \frac{1}{T} \sum_{i \in T^\pi} (c_i - a_i), \quad \bar{d}_L^\pi = \frac{1}{L} D_L^\pi = \frac{1}{L} \sum_{i \in L^\pi} (l_i - a_i),$$

and

$$\bar{d}^\pi = D^\pi / N = (D_T^\pi + D_L^\pi) / N = \frac{1}{N} \left( \sum_{i \in T^\pi} c_i + \sum_{i \in L^\pi} l_i - \sum_{i=1}^N a_i \right),$$

where the variables are as defined in section 2.1.

### Corollary 3.2

$$0 \leq \bar{d}_T^R - \bar{d}_T^F \leq (b-1) \frac{L}{N}.$$

*Proof.* Note that, as we observed earlier, since we assume arrivals occur at the same times under both front and rear dropping, completions and losses also occur at the same times under the two policies, i.e.,

$$\sum_{i \in T^F} c_i = \sum_{i \in T^R} c_i, \quad \sum_{i \in L^F} l_i = \sum_{i \in L^R} l_i.$$

Therefore,

$$D^F = D^R, \quad D_T^R - D_T^F = D_L^F - D_L^R = \sum_{i \in L^R} a_i - \sum_{i \in L^F} a_i.$$

By lemma 3.1, if the  $k^{th}$  cell to be lost under front dropping is cell  $i$ , then the  $k^{th}$  cell to be lost under rear dropping is cell  $i + b$ , so

$$\sum_{i \in L^R} a_i = \sum_{i \in L^F} a_{i+b}.$$

Because of the constant service time and FCFS discipline, if a cell is served, it will be served within  $b$  time units of its arrival under both front and rear dropping. Thus, under front dropping, if cell  $i$  is lost it must be the case that cell  $i + b$  arrived before cell  $i$  could be served, i.e.,  $a_{i+b} \leq a_i + b - 1$ . Also, by definition,  $a_i \leq a_{i+b}$ . Therefore

$$\sum_{i \in L^F} a_i \leq \sum_{i \in L^F} a_{i+b} \leq \sum_{i \in L^F} (a_i + b - 1) = \sum_{i \in L^F} a_i + L(b - 1),$$

and the result follows.  $\square$

In fact, the lower bound can be strengthened to  $\mathbf{d}_T^R \geq_{st} \mathbf{d}_T^F$ , where  $\mathbf{d}_T^\pi$  is the vector of delays of transmitted cells under policy  $\pi$ ,  $\pi = F, R$ . From lemma 3.1 it is easy to show that  $j^R(k) \leq j^F(k)$ , where  $j^\pi(k)$  is the  $k^{th}$  cell to be transmitted under policy  $\pi$ . That is, the  $k^{th}$  cell to be transmitted under  $R$  has an earlier arrival time than the  $k^{th}$  cell to be transmitted under  $F$ , but the departure time is the same under both policies. The same ideas can be used to show that for any dropping policy  $\pi$  that only drops cells when the buffer is full,  $i^R(k) \geq i^\pi(k) \geq i^F(k)$ , so  $j^R(k) \leq j^\pi(k) \leq j^F(k)$ , and therefore  $\mathbf{d}_T^R \geq \mathbf{d}_T^\pi \geq \mathbf{d}_T^F$ . Indeed, this is partially a corollary of lemmas 4.1 and 4.2 that appear later. Summarizing,

**Corollary 3.3** *For any arrival and service processes and any policy  $\pi$ , with probability 1,*

$$\mathbf{d}_T^F \leq \mathbf{d}_T^\pi \leq \mathbf{d}_T^R.$$

Therefore,  $\mathbf{d}_T^F \leq_{st} \mathbf{d}_T^\pi \leq_{st} \mathbf{d}_T^R$ .

### 3.2 Jitter for Front and Rear Dropping

Now let us consider the jitter, or variability of the delay. We will show that rear dropping minimizes the jitter. Let  $s(\pi)$  and  $t(\pi)$  be the first and last transmitted cells respectively under  $\pi$  for the given arrival and service processes. Let  $\hat{T}^\pi = T^\pi - s(\pi)$ . Also, if cell  $i$  is transmitted under  $\pi$ , we define  $e(i)$  to be the index of the last cell before cell  $i$  to be transmitted under  $\pi$  (the dependency on  $\pi$  is suppressed). We assume the system is initially empty.

The jitter under an arbitrary policy  $\pi$  is defined to be the sum of absolute differences in consecutive delays, i.e.,

$$J^\pi = \sum_{i \in \hat{T}^\pi} |(c_i - a_i) - (c_{e(i)} - a_{e(i)})|.$$

Note that although  $s(\pi)$  depends on  $\pi$ ,  $a_{s(\pi)}$  and  $c_{s(\pi)}$  do not. This is because of the assumption that  $C(t) \geq 1$  whenever there are cells in the buffer so that at least one cell in the first batch is transmitted. That is,  $a_{s(\pi)}$  is the time of the first batch of arrivals and  $c_{s(\pi)} = a_{s(\pi)} + 1$ . Similarly,  $a_{t(\pi)}$  and  $c_{t(\pi)}$  do not depend on  $\pi$  although  $t(\pi)$  does. These arguments are in fact valid for the first and last cells transmitted within each busy period. Indeed, the busy periods do not depend on dropping policy  $\pi$ . Note that the jitter of  $\pi$  for the whole set of transmitted cells is the sum of jitters within each of the busy periods, plus the delay differences between the first transmitted cell in each busy period and the last transmitted cell in the previous busy period. Since these last delay differences are independent of  $\pi$ , when we compare the jitters resulting from different dropping policies, it suffices to consider a single busy period. Hence in the remaining part of this subsection we *redefine*  $N$  to be the number of arrivals during an arbitrary busy period for arbitrary arrival and service processes, and we index the cells starting from the first cell to arrive in the busy period, i.e.,  $i = 1, \dots, N$ .

Since there is at least one departure in every time slot during a busy period (recall that  $C(t) \geq 1$ ), we have  $c_i - c_{e(i)} \leq 1$ , for  $i \in T^\pi$ . We assume, without loss of generality, that servers are numbered  $1, 2, \dots$  and that server 1 is always available during the busy period, and that when there are multiple servers, the cell served by server 1 has the smallest index. Let  $\tilde{T}^\pi$  be the subset of  $\hat{T}^\pi$  containing cells which are transmitted by server 1. Let  $\tilde{N} = |\tilde{T}^\pi|$  be the number of cells in  $\tilde{T}^\pi$ . Note that  $\tilde{N}$  equals the length of the busy period and is independent of  $\pi$ .

Therefore, letting  $I\{\bullet\}$  be the indicator function, the jitter can be rewritten as

$$\begin{aligned} J^\pi &= \sum_{i \in \hat{T}^\pi - \tilde{T}^\pi} |a_i - a_{e(i)}| + \sum_{i \in \tilde{T}^\pi} |a_i - a_{e(i)} - 1| \\ &= \sum_{i \in \hat{T}^\pi - \tilde{T}^\pi} (a_i - a_{e(i)}) + \sum_{i \in \tilde{T}^\pi} (a_i - a_{e(i)} - 1)I\{a_i > a_{e(i)}\} + \sum_{i \in \tilde{T}^\pi} I\{a_i = a_{e(i)}\} \end{aligned}$$

$$\begin{aligned}
&= \sum_{i \in \hat{T}^\pi} (a_i - a_{e(i)}) - \sum_{i \in \tilde{T}^\pi} I\{a_i > a_{e(i)}\} + \sum_{i \in \tilde{T}^\pi} I\{a_i = a_{e(i)}\} \\
&= a_{t(\pi)} - a_{s(\pi)} - (\tilde{N} - \sum_{i \in \tilde{T}^\pi} I\{a_i = a_{e(i)}\}) + \sum_{i \in \tilde{T}^\pi} I\{a_i = a_{e(i)}\} \\
&= -\tilde{N} + a_{t(\pi)} - a_{s(\pi)} + 2 \sum_{i \in \tilde{T}^\pi} I\{a_i = a_{e(i)}\}.
\end{aligned}$$

Therefore, to minimize jitter, we want to minimize  $\sum_{i \in \tilde{T}^\pi} I\{a_i = a_{e(i)}\}$ .

For any policy,  $\sum_{i=2}^N I\{a_i = a_{i-1}\}$  is constant and is equal to the number of cells that arrive in batches of size greater than one minus the number of such batches. This is an upper bound for  $\sum_{i \in \tilde{T}^\pi} I\{a_i = a_{e(i)}\}$ , and the upper bound is attained, i.e.,  $\sum_{i \in \tilde{T}^\pi} I\{a_i = a_{e(i)}\} = \sum_{i=2}^N I\{a_i = a_{i-1}\}$ , if no cells are lost from batches of arrivals with size greater than one. A lower bound for  $\sum_{i \in \tilde{T}^\pi} I\{a_i = a_{e(i)}\}$  is  $\sum_{i=2}^N I\{a_i = a_{i-1}\} - L$ . To minimize  $\sum_{i \in \tilde{T}^\pi} I\{a_i = a_{e(i)}\}$  we need to maximize the number of transmitted cells that come from different batches. That is, we want lost cells to be from the same batch. Thus, we obtain

**Theorem 3.4** *For fixed arrival and service processes, any dropping policy which only drops cells from the same batch minimizes the jitter with probability 1.*

Indeed, any such dropping policy attains the lower bound,  $\sum_{i \in \tilde{T}^\pi} I\{a_i = a_{e(i)}\} = \sum_{i=2}^N I\{a_i = a_{i-1}\} - L$ . As a consequence,

**Corollary 3.5** *For fixed arrival and service processes, rear dropping minimizes the jitter with probability 1.*

### 3.3 Loss Burstiness for Front and Rear Dropping

We now mathematically characterize the burstiness of losses for a dropping policy and show that under this definition the loss burstiness for front and rear dropping is the same.

Let the loss burstiness of a dropping policy  $\pi$  be defined as a vector  $LB^\pi = (LB_1, LB_2, \dots, LB_L)$  where  $LB_i$  is the number of consecutive losses in the  $i^{th}$  group of consecutive losses;  $LB_i$  is defined to be 0 if there are fewer than  $i$  groups of losses. More rigorously, we recursively define  $l_i$  and  $t_i$ ,  $i = 1, \dots, L$ , as follows. Let  $l_i$  be the index of the first loss in the  $i^{th}$  group of consecutive losses, so  $l_i = \min\{j : j \in L^\pi \text{ and } j > t_{i-1}\}$  if  $\{j : j \in L^\pi \text{ and } j > t_{i-1}\}$  is non-empty; let  $l_i = N + 1$  otherwise. Similarly, let  $t_i$  be the first cell to be transmitted after the  $i^{th}$  group of consecutive losses,

so  $t_i = \min\{j : j \in T^\pi \text{ and } j > l_i\}$  if  $\{j : j \in T^\pi \text{ and } j > l_i\}$  is non-empty and let  $t_i = N + 1$  otherwise. Then  $LB_i = t_i - l_i$ . We will refer to  $LB_i$  as the group size of the  $i^{th}$  group of losses. Note that the “ideal” loss burstiness is the vector with all components equal to 1, that is, where each loss is isolated.

Now consider front and rear dropping for fixed arrival and service processes. From lemma 3.1 the group sizes for consecutive losses are the same for front and rear dropping since the indices of lost cells are just shifted. That is, we have the following corollary.

**Corollary 3.6** *For fixed arrival and service processes, with probability 1,*

$$LB^F = LB^R.$$

Moreover, the  $i^{th}$  group size of losses for both policies is just the number of losses the  $i^{th}$  time there are losses. To see this, first recall that the number of transmissions, the number of losses, and the queue size is the same for all time slots for any dropping policy. If we have a set of losses in a particular time slot, under both front and rear dropping they will be consecutive losses. Also, because of our slotted system, at least one cell will be transmitted before the next set of losses occurs. Suppose in a particular time slot we have a set of losses, and let  $j$  ( $j + b$ ) be the index of the last lost cell in that set under policy  $F$  ( $R$ ). Then under  $F$  cell  $j + 1$  will be transmitted in the next time slot, and under  $R$  a cell will be transmitted in the next time slot so cell  $j + b + 1$  will be able to enter the buffer, and will not be dropped. Thus, the set of lost cells in any time slot will be separated from the set of lost cells in any other time slot by at least one transmitted cell in both policies.

We next define the split dropping policy ( $S$ ) that we prove to have less loss burstiness than front or rear dropping.

## 4 The Split Dropping Policy

As we saw in the previous section, a problem with both front and rear dropping is that every time there is a set of losses, they will be consecutive losses. We propose the following split policy, with parameter  $\theta$ ,  $\theta \in \{0, 1, \dots, b\}$ , which we call  $S(\theta)$ , or just  $S$  when we need not denote the dependency on  $\theta$ . Suppose that in the current time slot we have losses, and that  $a$  cells must be dropped. Again we assume there is a “virtual” buffer that includes the “real buffer” such that all arrivals are placed in the buffer in order after the cells that are already present, so that in the current time slot there are cells in positions  $1, \dots, b + a$ . If  $a \leq \theta$  then we drop the first  $a$  cells in the buffer, as in front dropping, and move the remaining cells up into the “real” buffer. If  $a > \theta$  then we drop the first  $\theta$  cells in the buffer as well as the cells in positions  $b + 1, b + 2, \dots, b + a - \theta$ , and then move the remaining cells into the

real buffer. Thus the dropped cells of the current time slot are “split” or separated, though now, as we will see, consecutive losses can occur in more than one time slot. Note that  $S(b) = F$  and  $S(0) = R$ .

It will be convenient to define another dropping policy, which we call the batch policy with parameter  $\theta$ ,  $B(\theta)$ . Under  $B(\theta)$  if we have  $b + a$  cells in our virtual buffer, we drop the cells in buffer positions  $b - \theta + 1, \dots, b - \theta + a$ . Thus  $B(b) = F$  and  $B(0) = R$ .

Let  $\Phi(\theta)$ ,  $\theta \in \{0, 1, \dots, b\}$ , be the set of all policies defined as follows. Suppose that in a particular time slot  $a$  is the total number of cells that must be dropped (the total buffer overflow). Then a policy  $\pi$  is in  $\Phi(\theta)$  if it drops  $\min\{a, \theta\}$  cells from the real buffer, that is from among positions  $1, \dots, b$ , and drops the remaining  $\max\{a - \theta, 0\}$  from outside of the real buffer, that is, from among positions  $b + 1, \dots, b + a$ . Thus,  $S(\theta) \in \Phi(\theta)$  and  $B(\theta) \in \Phi(\theta)$ . We permit policies in  $\Phi(\theta)$  that vary over time and depend on the state.

#### 4.1 Delay for the Split Dropping Policy

We first show the following lemmas regarding the delays of the proposed policies.

**Lemma 4.1** *For all  $\theta \in \{0, 1, \dots, b\}$ , for all  $\pi \in \Phi(\theta)$ ,*

$$\mathbf{d}^{S(\theta)} \leq \mathbf{d}^\pi$$

*with probability 1, assuming  $S(\theta)$  and  $\pi$  start in the same state and have the same arrival and service processes.*

*Proof.* Let  $\pi$  be an arbitrary dropping policy in  $\Phi(\theta)$ , and let  $p^\pi(i)$  ( $p^S(i)$ ),  $i = 1, \dots, n$  be the index of the cell in position  $i$  of the (real) buffer at the beginning of a time slot (just before a transmission and after implementing the loss policy), where  $0 \leq n \leq b$  is the number of cells in the buffer (the queue length). As we noted before, the queue lengths, departure times, and loss times will be the same under any policy with the same arrival process, so  $n$  does not depend on the policy. We will show by induction on the time slots that for each slot,

$$p^\pi(i) \leq p^S(i)$$

for  $i = 1, \dots, n$ . The lemma will follow from this, since the cell that is transmitted in a time slot is in the first position, i.e., cell  $p(1)$ . A smaller index for a transmitted cell means an earlier arrival time, which means for the same transmission time the delay is greater.

Note that because cells always enter the buffer in order and leave in order (because of the FCFS service discipline, we have for  $i = 1, \dots, n-1$ ,

$$p^\pi(i) \leq p^\pi(i+1), \quad p^S(i) \leq p^S(i+1).$$

For the first time slot  $p^\pi(i) \leq p^S(i)$  because both policies start in the same state. Let us suppose  $p^\pi(i) \leq p^S(i)$  at the beginning of time slot  $t$  and consider time slot  $t+1$ . The cell in position 1 (if there is one) will have been transmitted and there will be  $a'$ , say, new arrivals. If  $a' + n - 1 \leq b$  then all the new arrivals will enter the buffer in order, and the inequality will be preserved. Suppose  $a := a' + n - 1 - b > 0$ . Then the new arrivals enter the virtual buffer in order and  $p^\pi(i) \leq p^S(i)$  still holds for the vector of cells occupying positions in the virtual buffer, i.e., when  $n$ ,  $p^\pi(i)$ , and  $p^S(i)$ , are redefined to be the number of cells in the virtual buffer and the index of the cell in position  $i$  in the virtual buffer at the beginning of time slot  $n$ , *before* implementation of the dropping policy. Let  $r^\pi = (r_1^\pi, \dots, r_b^\pi)$  ( $r^S = (r_1^S, \dots, r_b^S)$ ) be the positions in the virtual buffer of the cells that remain after the dropping policy for time slot  $t+1$  is implemented, but before the remaining cells are moved up into the virtual buffer. Then, if  $a \geq \theta$ ,  $r^S = (\theta+1, \theta+2, \dots, b-1, b, b+a-\theta+1, \dots, b+a)$ , and if  $a < \theta$ ,  $r^S = (a+1, a+2, \dots, b+a)$ . Thus, in either case  $r_i^\pi \leq r_i^S$ ,  $i = 1, \dots, b$ , for all  $\pi \in \Phi(\theta)$ . Therefore,  $p^\pi(r_i^\pi) \leq p^\pi(r_i^S) \leq p^S(r_i^S)$ , so  $p^\pi(i) \leq p^S(i)$  for time slot  $t+1$  *after* implementing the dropping policy, and we are done.  $\square$

The same argument gives us the following.

**Lemma 4.2** *For any fixed arrival and service processes, for all  $\theta \in \{0, 1, \dots, b-1\}$ ,*

$$\mathbf{d}^{S(\theta+1)} \leq \mathbf{d}^{S(\theta)}, \quad \mathbf{d}^{B(\theta+1)} \leq \mathbf{d}^{B(\theta)}.$$

The following lemma corresponds to lemma 3.1. There is no corresponding shifted relationship between lost cells under policies  $S(\theta)$  and  $F$ .

**Lemma 4.3** *For all  $0 \leq \theta \leq b$ ,*

$$i^{B(\theta)}(k) = i^F(k) + b - \theta.$$

*Proof.* The argument is similar to that of lemma 3.1. Consider any time slot in which there are losses, say  $a$  of them. As we noted before, under FCFS with front dropping, the cells in the virtual buffer always have consecutive indices. Also, under  $B(\theta)$ , the cells in positions  $b - \theta + 1, \dots, b + a$  must all have indices after the index of the cell dropped the last time any cells were dropped, and they therefore must have consecutive indices. In other words, under  $B(\theta)$  we can think of the virtual

buffer as being split into two buffers, one with buffer positions  $1, \dots, b - \theta$  from which cells are never dropped, and the other with buffer positions  $b - \theta + 1, \dots, b + a$  in which the policy is front dropping and which feeds into the first sub-buffer. Cells in the second sub-buffer always have consecutive indices. Therefore, let  $l$  be such that the indices of the cells in positions  $b - \theta + 1, b - \theta + 2, \dots, b - \theta + a$  are  $l + 1, l + 2, \dots, l + a$  under both policies. Then cells  $l + 1, \dots, l + a$  are lost under  $B(\theta)$  and cells  $l + 1 - (b - \theta), \dots, l + a - (b - \theta)$  are lost under  $F$ .  $\square$

We also have the following corollary, which is analogous to corollary 3.2. The first inequality follows from lemmas 4.1 and 4.2 and the fact that  $F = S(b)$ , the second follows from lemma 4.1, and the third follows from lemma 4.3 in the same way as corollary 3.2 follows from lemma 3.1.

**Corollary 4.4**

$$0 \leq \bar{d}_T^{S(\theta)} - \bar{d}_T^F \leq \bar{d}_T^{B(\theta)} - \bar{d}_T^F \leq (b - \theta - 1) \frac{L}{N}.$$

## 4.2 Loss Burstiness for the Split Dropping Policy

Now let us consider the loss burstiness of our proposed policies. From lemma 4.3 we have the following generalization corollary 3.6.

**Corollary 4.5** *For any fixed arrival and service processes, for all  $\theta$ ,*

$$LB^{B(\theta)} = LB^F = LB^R.$$

We first recall a basic majorization lemma for integer vectors. Let  $\mathbf{a}$  and  $\mathbf{b}$  be  $L$  dimensional integer vectors (that is, all their components are integers). The transformation from  $\mathbf{b}$  to  $\mathbf{b}'$  is called a transfer if, for  $b_i > b_j$ ,  $b'_i = b_i - 1$ ,  $b'_j = b_j + 1$ , and  $b'_k = b_k$ ,  $k \neq i, j$ . We have the following lemma which is due to Muirhead (see Marshall and Olkin, 1979, Lemma 5.D.1).

**Lemma 4.6** *If  $\mathbf{a}$  and  $\mathbf{b}$  are integer vectors and  $\mathbf{a} \prec \mathbf{b}$ , then  $\mathbf{a}$  can be derived from  $\mathbf{b}$  by successive applications of a finite number of transfers.*

Our main result for this section is the following, which, along with the corollary above, shows that our split dropping policy is better than front or rear dropping in terms of loss burstiness in the sense that the losses are grouped into more groups of smaller size under the split policy.

**Theorem 4.7** *For any fixed arrival and service processes, for all  $\theta$ ,*

$$LB^{S(\theta)} \prec LB^{B(\theta)} = LB^F = LB^R.$$



Therefore, for stochastic arrival and service processes, for all  $\theta$ ,

$$LB^{S(\theta)} \leq_{scx} LB^{B(\theta)} =_{st} LB^F =_{st} LB^R.$$

*Proof.* Let us fix  $\theta$ ,  $1 \leq \theta \leq b - 1$ , and let  $B = B(\theta)$  and  $S = S(\theta)$ . First consider  $LB^B$ . As we noted in section 3.2, for front and rear dropping, and hence for  $B$  by corollary 4.5, the  $i^{th}$  group size of losses is just  $L_i$ , the number of losses the  $i^{th}$  time there are losses. Suppose losses occur  $M$  times during the first  $N$  arrivals. Then,  $LB^B = (L_1, \dots, L_M, 0, 0, \dots, 0)$ , where the number of 0's is  $L - M$ . Note that a lower bound, in the sense of majorization, for  $LB$  for any dropping policy is  $(1, 1, \dots, 1)$ , where there are  $L$  1's. Let  $x_i$  ( $y_i$ ) be the number of cells that are dropped from within the real buffer (from outside of the real buffer) the  $i^{th}$  time there are losses under both policies  $B$  and  $S$ . Note that for all  $i = 1, \dots, M$ ,  $L_i = x_i + y_i$ ,  $0 \leq x_i \leq \theta$ , and if  $y_i > 0$  then  $x_i = \theta$ . Therefore, since the order in which components appear in a vector does not matter for majorization comparisons, we can write  $LB^B = (x_{[1]} + y_{[1]}, \dots, x_{[M]} + y_{[M]}, 0, 0, \dots, 0)$ , where  $x_{[i]}$  (resp.  $y_{[i]}$ ) is the  $i^{th}$  largest component in the vector  $\mathbf{x} = (x_1, \dots, x_M)$  (resp.  $\mathbf{y} = (y_1, \dots, y_M)$ ).

Let  $X_i^\pi$  ( $Y_i^\pi$ ) be the sets of indices of the cells dropped from within the real buffer (from outside of the real buffer) the  $i^{th}$  time there are losses,  $\pi = S, B$ ,  $i = 1, \dots, M$ . ( $Y_i^\pi$  may be empty.) Then  $Y_i^\pi$  (if it is nonempty) contains consecutive indices under both policies, and under  $B$ ,  $X_i^B$  contains consecutive indices, and  $Y_i^B$  (if it is nonempty) will be consecutive with  $X_i^B$ . We will also speak generically of “ $X$  groups” and “ $Y$  groups.” We say that two groups “group together” if the union of the two groups is a set of consecutive indices. So, for example under  $B$ ,  $X_i^B$  groups together with  $Y_i^B$  (if it is nonempty) for each  $i$ .

Now consider the split policy,  $S$ . It is possible under  $S$  that  $X_i^S$  does not contain consecutive indices. When this happens, there is a group  $Y_j^S$  such that  $X_i^S$  and  $Y_j^S$  are grouped together in the sense that their union is a set of consecutive indices. As a specific example, consider a system with one server,  $b = 4$ ,  $\theta = 2$ , cells 1, 2, ..., 7 arrive in the first time slot, cells 8, 9, and 10 arrive in the second time slot, and there are no further arrivals. Then under policy  $S$ , cells 1, 2, and 5 will be dropped ( $X_1^S = \{1, 2\}$ ,  $Y_1^S = \{5\}$ ) and cell 3 will be transmitted in the first time slot, cells 4 and 6 will be dropped ( $X_2^S = \{4, 6\}$ ,  $Y_2^S = \emptyset$ ) and cell 7 will be transmitted in the second time slot. Cells 8, 9, and 10 will be transmitted in the following time slots. Hence, cells 4, 5, and 6 form a group of consecutive losses, and  $LB^S = (2, 3, 0, 0, 0)$ . (Under policy  $B$ , cells 3, 4, 5, 7, and 8 will be dropped, and  $LB^B = (3, 2, 0, 0, 0)$  which equals  $LB^S$  in the majorization sense.)

It is also possible under  $S$  that for some  $i < j$ ,  $X_j^S$  is consecutive with  $Y_i^S$ , that is, the largest index in  $Y_i^S$  equals the smallest index in  $X_j^S$  minus 1. For example, suppose there is one server,  $b = 2$ ,  $\theta = 1$ , cells 1, 2, 3, and 4 arrive in the first time slot, cells 5 and 6 arrive in the second time slot, and there are

no further arrivals. Then under policy  $S$ , cells 1 and 3 will be dropped ( $X_1^S = \{1\}$ ,  $Y_1^S = \{3\}$ ) and cell 2 will be transmitted in the first time slot, cell 4 will be dropped ( $X_2^S = \{4\}$ ,  $Y_2^S = \emptyset$ ) and cell 5 will be transmitted in the second time slot, and cell 6 will be transmitted in the third time slot. Hence, cells 3 and 4 form a group of consecutive losses, and  $LB^S = (1, 2, 0)$ . (Under policy  $B$ , cells 2, 3, and 5 will be dropped, and  $LB^B = (2, 1, 0)$  which equals  $LB^S$  in the majorization sense.)

Let us consider the possible ways under policy  $S$  that the  $X_i^S$ 's and  $Y_j^S$ 's can group together. Let  $\hat{x}_i$  and  $\hat{y}_j$  ( $\bar{x}_i$  and  $\bar{y}_j$ ) be the largest (smallest) index in  $X_i^S$  and  $Y_j^S$ , for non-empty  $Y_j^S$ 's, respectively. We have the following properties.

**P1** For each  $i = 1, \dots, M-1$  there exists  $t$  such that  $\hat{x}_i < t < \bar{x}_{i+1}$  and such that cell  $t$  is transmitted.

This is because a cell with an index larger than  $\hat{x}_i$  be at the head of the queue after the cells in  $X_i^S$  and  $Y_i^S$  are dropped, and will be transmitted during the next time slot, before any cells in  $X_{i+1}^S$  are dropped. A consequence is that for  $i \neq j$ ,  $X_i^S$  and  $X_j^S$  cannot group together, and, for  $i \leq j$ ,  $X_i^S$  and  $Y_j^S$  cannot group together.

**P2**  $\bar{y}_j > \hat{y}_i + \theta + 1$  for all  $i < j$  such that  $Y_i^S$  and  $Y_j^S$  are nonempty. This is because cells  $\hat{y}_i + 1, \dots, \hat{y}_i + \theta + 1$  will enter the real buffer after the cells in  $X_i^S$  (whose cardinality is  $\theta$  as  $Y_i^S$  is nonempty) and  $Y_i^S$  are dropped. Note that there is at least one cell departure at each time slot. A consequence is that for  $i \neq j$ ,  $Y_i^S$  and  $Y_j^S$  cannot group together.

Our properties imply that groups of consecutive losses under  $S$  will consist of either individual  $X$  or  $Y$  groups or groups of the form  $Y_i^S \cup X_j^S$  with  $i < j$ . Indeed, due to P1, there can never be groups of the form  $X_i^S \cup X_j^S$  for  $i \neq j$ , or  $X_i^S \cup Y_j^S$  with  $i < j$ . Also, in view of P2, no two  $Y$  groups can group together, nor can they be bridged by an  $X$  group (whose cardinality is bounded above by  $\theta$ ), i.e. there can be no groups of consecutive losses of the form  $Y_i^S \cup X_j^S \cup Y_k^S$  with  $i \neq k$ . Thus, the only possible merged groups have the form  $Y_i^S \cup X_j^S$  with  $i < j$ .

Let  $g \leq M$  be the number of groups of the form  $X_i^S \cup Y_j^S \cup X_i^S$  under  $S$ , let  $j_1, \dots, j_g$  and  $i_1, \dots, i_g$  be the indices of the corresponding  $Y_j^S$ 's and  $X_i^S$ 's respectively, and let  $k_1, \dots, k_{M-g}$  and  $l_1, \dots, l_{M-g}$  be the indices of the  $Y_j^S$ 's and  $X_i^S$ 's respectively that are unmatched (or empty) under  $S$ . Then  $LB^S = (x_{i_1} + y_{j_1}, \dots, x_{i_g} + y_{j_g}, x_{k_1}, \dots, x_{k_{M-g}}, y_{l_1}, \dots, y_{l_{M-g}}, 0, 0, \dots, 0)$ . Let  $LB' = (x_{i_1} + y_{j_1}, \dots, x_{i_g} + y_{j_g}, x_{k_1} + y_{l_1}, \dots, x_{k_{M-g}} + y_{l_{M-g}}, 0, 0, \dots, 0)$ , where the number of 0's in the vectors is such that they each have  $L$  components. Then, from our transfer lemma, lemma 4.6,  $LB^S \prec LB'$ . Moreover, using the rearrangement inequalities (Propositions 6.A.1 and 6.A.2, p.140) of Marshal and Olkin (1979), we obtain  $LB' \prec LB^B = (x_{[1]} + y_{[1]}, \dots, x_{[M]} + y_{[M]}, 0, 0, \dots, 0)$ . Therefore,  $LB^S \prec LB^B$ .  $\square$

Let us now consider the distribution of the size of groups of losses under our policies. Let  $P_k^\pi$  be the proportion of nonzero loss groups that have size at least  $k$  under policy  $\pi$  for the first  $N$  arrivals. We have the following.

**Corollary 4.8** *For a fixed arrival process, for all  $\theta$ , and for  $k \geq \theta$ ,*

$$P_k^{S(\theta)} \leq P_k^{B(\theta)}.$$

*That is,  $S(\theta)$  is less likely to have large groups of consecutive losses than  $B(\theta)$ .*

*Proof.* Fix  $\theta$  and let  $S$ ,  $B$ ,  $M$ , and  $L_i$  be as defined in the previous proof. We have that

$$P_k^B = \frac{n_k^B}{M},$$

where

$$n_k^B = \sum_{i=1}^M I\{L_i \geq k\}$$

is the number of groups with size at least  $k$  under policy  $B$ , and  $I$  is the indicator function. Also,

$$P_k^S = \frac{n_k^S}{g'},$$

where  $n_k^S$  is the number of groups with size at least  $k$  under policy  $S$ , and where  $g'$  is the number of groups under  $S$ . From the previous proof it is easy to see that  $g' \geq M$  and that for  $k \geq \theta$ ,  $n_k^S \leq n_k^B$  so that  $P_k^S \leq P_k^B$ .  $\square$

## 5 Comparison of Dropping Policies by Simulation

We now investigate the effects of the threshold on different dropping policies. We further compare the policies  $S(\theta)$  and  $B(\theta)$  with a random dropping policy  $U(\theta)$ . The policy  $U(\theta)$  is similar to  $S(\theta)$  and  $B(\theta)$  except that the  $\min(\theta, a)$  cells to be dropped from the real buffer are chosen randomly according to a uniform distribution. If  $a > \theta$  the cells in positions  $b+1, b+2, \dots, b+a-\theta$  in the virtual buffer are also dropped.

We used the simulator developed by N. Niclausse at INRIA to generate different curves of the average delay, the sample variance of the sizes of groups of consecutive losses, and the jitter. In our experimentation, we have chosen the buffer size as 10. There is a single server:  $C(t) \equiv 1$ .

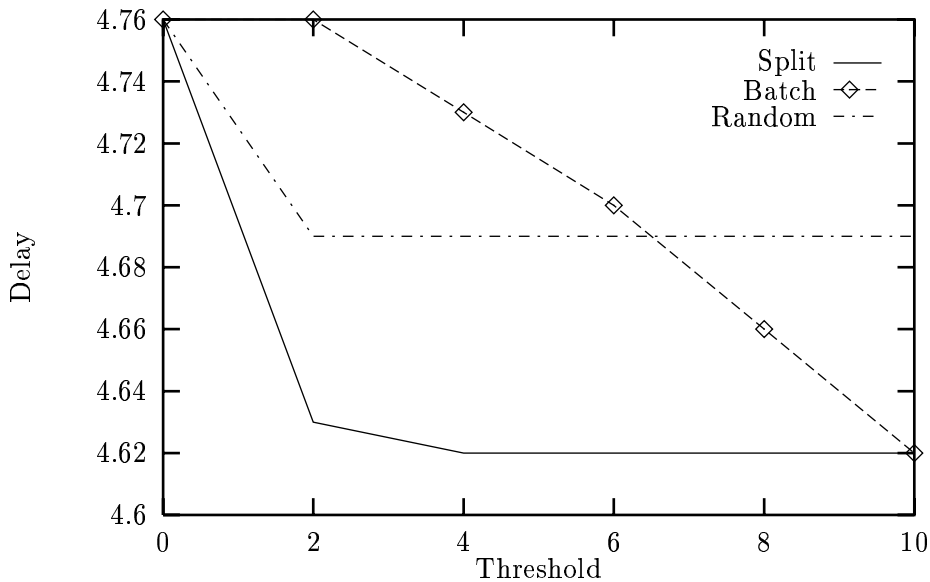


Figure 1: Cell Delay with Poisson Arrivals

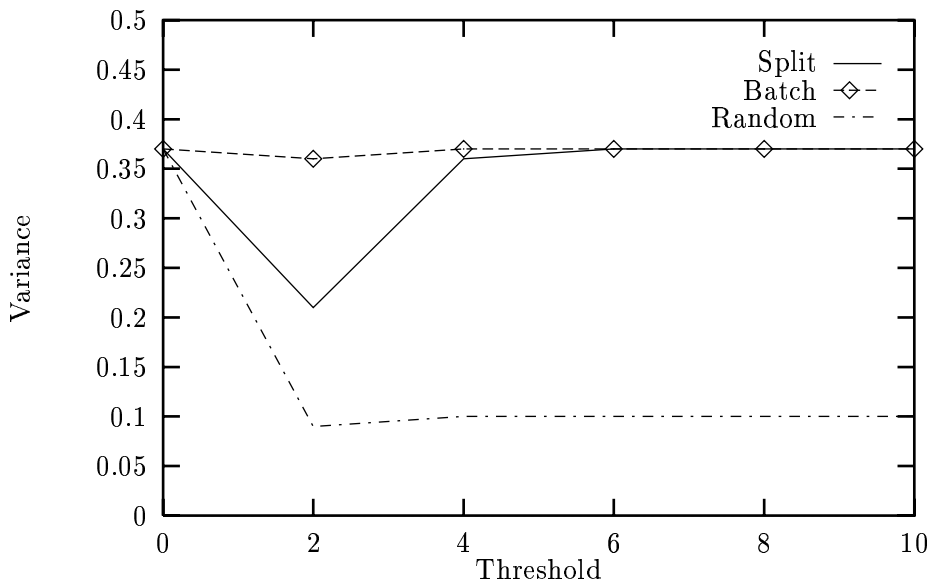


Figure 2: Variance of Consecutive Losses with Poisson Arrivals

We consider two (extreme) input traffic processes. In the first one the number of arriving cells in each time slot has a Poisson distribution. The input rate is 0.95. The simulation results are reported in Figures 1–3.

The second input traffic process has long-range dependence. It is defined as the number of busy servers in the  $M/G/\infty$  model of Cox (1984). The arrivals to the  $M/G/\infty$  queue follow a Poisson process with parameter  $\lambda$ , and service times are i.i.d. with a Pareto distribution with parameter  $\alpha > 1$ . Let  $\overline{F}(x)$  be the tail distribution of the service times, and  $\sigma$  be a strictly positive real number,

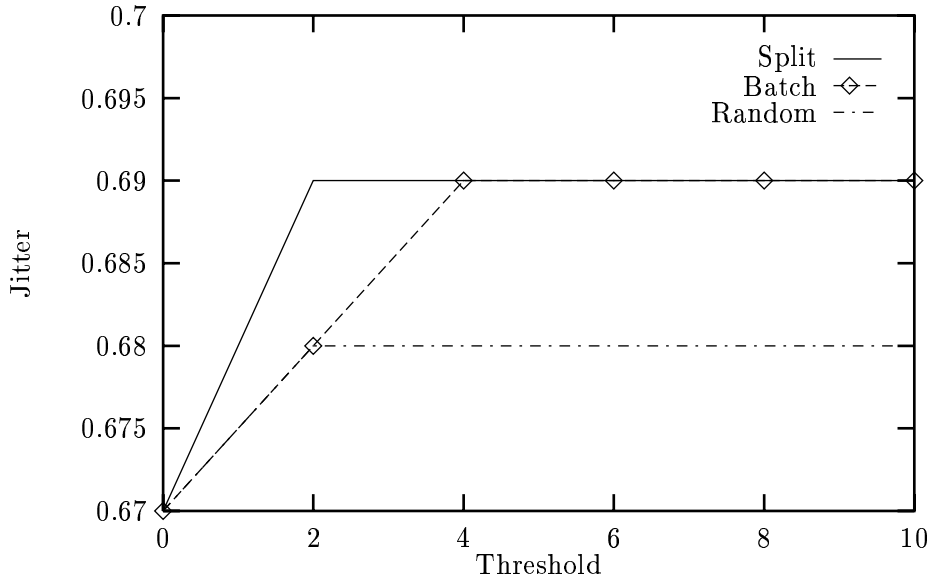


Figure 3: Jitter with Poisson Arrivals

so

$$\overline{F}(x) = \begin{cases} 1, & x < \sigma \\ (\frac{x}{\sigma})^{-\alpha} & \end{cases}.$$

The expectation of the service times is  $\sigma\alpha/(\alpha - 1)$ , and the average number of busy servers in the system is  $\lambda\sigma\alpha/(\alpha - 1)$ . Assume that  $1 < \alpha < 2$ . It is known that the process of the number of busy servers in the  $M/G/\infty$  model has long-range dependence and is asymptotically self-similar with Hurst parameter  $H = (3 - \alpha)/2$ . This process is used as our input traffic process.

More specifically, we first simulate the  $M/G/\infty$  queueing system. We take the *number of busy servers* at integer time instants in this queueing system as the *number of cells* arrived in each time slot in the discrete-time  $G/D/C(t)/b$  queueing system.

The simulation results are reported in Figures 4–6, where  $\lambda = 0.3125$ ,  $\alpha = 1.2$ ,  $\sigma = 0.5$ . Thus, the input rate is 0.9375, and the Hurst parameter is 0.9.

It is not surprising to see that the delays under all these policies are decreasing in the threshold  $\theta$ . This confirms the theoretical monotonicity properties established for split and batch policies (lemma 4.2). The delay under the batch policy decreases almost linearly in  $\theta$ , whereas under the split and random policies the effect of the parameter  $\theta$  on the delay vanishes quickly.

The loss burstiness (measured here by the sample variance of the size of loss groups) under the batch policy is very flat. However, under the other two policies, the effect of the parameter  $\theta$  is quite important for small values of  $\theta$ . Note that there is no monotonicity of the loss burstiness with respect to  $\theta$ , at least not under the split policy.

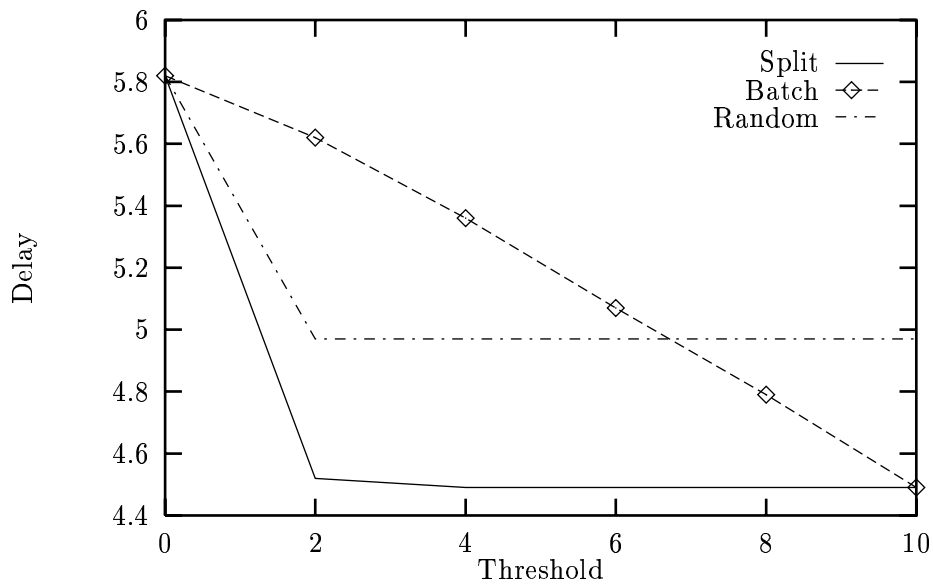


Figure 4: Cell Delay with Long-Range-Dependence Arrivals

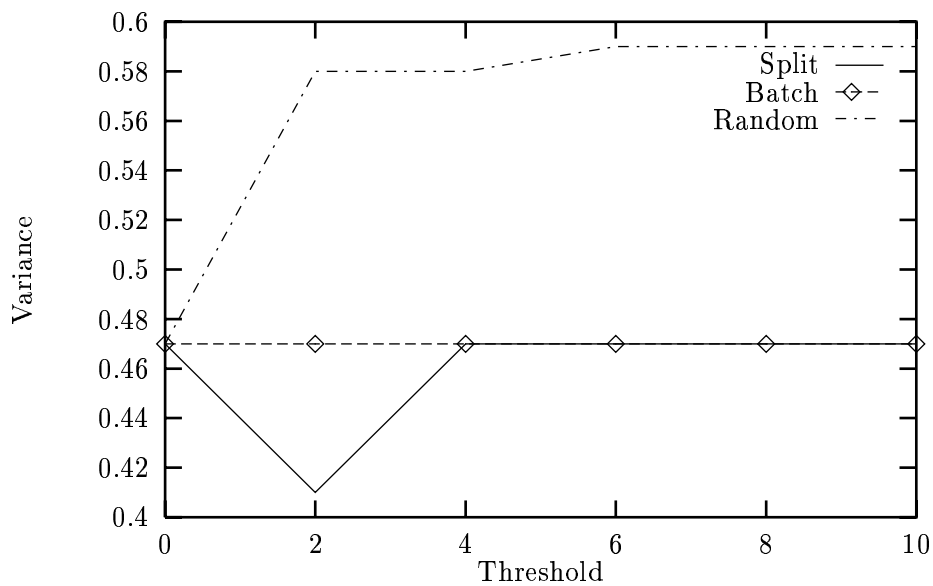


Figure 5: Variance of Consecutive Losses with Long-Range-Dependence Arrivals

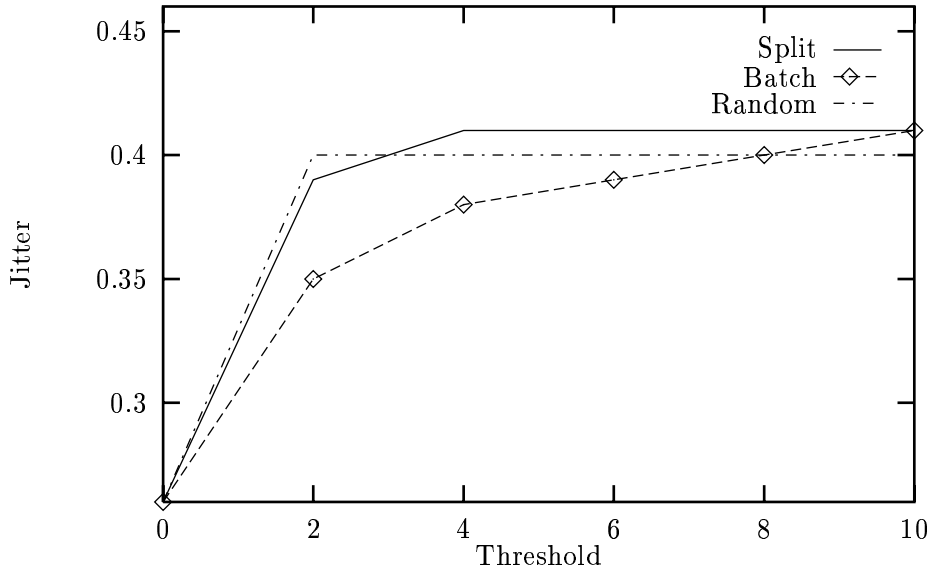


Figure 6: Jitter with Long-Range-Dependence Arrivals

The simulation results also indicate that the jitter increases in  $\theta$  under all the three policies. This is consistent with the fact that when  $\theta = 0$ , all three policies reduce to rear dropping which was shown to minimize the jitter (corollary 3.5).

Observe that the behaviors of the split and batch policies are quite similar for the two input traffic processes. The delay and loss burstiness (resp. jitter) are smaller (resp. larger) under the split policy than under the batch policy. The random policy, however, behaves differently in comparison with the other two policies with respect to loss burstiness and jitter. With the long-range dependent arrival process the random policy yields the highest variability in loss burstiness. Also, the random dropping policy has the smallest jitter with Poisson arrivals, whereas it has larger jitter than that of batch dropping in most of the cases with long-range dependent arrivals.

## 6 Conclusions

In this paper we have analyzed the impact of different cell dropping policies on the performance measures like cell delay, jitter, and loss burstiness. We have considered a discrete-time queueing system with a single finite-capacity queue and a time-varying number of deterministic servers. We have proposed split dropping and batch dropping policies, which are parameterizable policies and have as special cases the usual rear and front dropping policies when the parameter (threshold) is set to 0 and the buffer size, respectively. We have shown that the delay is stochastically decreasing in the threshold, and that front (rear) dropping minimizes (maximizes) the delay. With respect to the loss burstiness, we have shown that these last two policies are identical. We have also shown that split

dropping yields smaller loss burstiness and delay than the rear dropping. For the minimization of jitter, however, we have proved that rear dropping is optimal.

In addition to these theoretical results, we have also used simulation to evaluate the impact of the parameter of the dropping policies on the performance measures. We have compared the above mentioned policies with a uniformly distributed random-dropping policy, assuming two (somewhat extreme) input traffic patterns, Poisson arrivals and a process with long-range-dependence. The behavior of the split and batch policies are quite similar for the two input traffic processes. The delay and loss burstiness (resp. jitter) are smaller (resp. larger) under the split policy than under the batch policy. The loss burstiness and jitter of the random policy relative to split and batch policies depends on the input traffic process.

We conjecture that the jitter is an increasing function of  $\theta$  under all the three policies. This conjecture is supported by the simulation results, but we were unable to prove it.

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Unité de recherche INRIA Lorraine, Technopôle de Nancy-Brabois, Campus scientifique,

615 rue du Jardin Botanique, BP 101, 54600 VILLERS LÈS NANCY

Unité de recherche INRIA Rennes, Irisa, Campus universitaire de Beaulieu, 35042 RENNES Cedex

Unité de recherche INRIA Rhône-Alpes, 655, avenue de l'Europe, 38330 MONTBONNOT ST MARTIN

Unité de recherche INRIA Rocquencourt, Domaine de Voluceau, Rocquencourt, BP 105, 78153 LE CHESNAY Cedex

Unité de recherche INRIA Sophia-Antipolis, 2004 route des Lucioles, BP 93, 06902 SOPHIA-ANTIPOLIS Cedex

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